

<sup>1</sup> COMP6481 Solving Problems Assignment Part B

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## **1 Introduction**

After using the given data frames to come up with a constructive response to why and how the University's environment score could be improved, I can confirm there are some areas that have room for improvement, for example staff contribution and an increase in doctorates. The suggestions I am providing for increasing the universities environment score have come from comparing the REF 2021 data groups with these being universities with a better environment score and universities with a worse environment score

The aim of providing evidence to support my suggestions is so the university can prepare for the next REF assessment and ultimately increase their environment score, I believe that the suggestions that follow will lead to a positive impact to the environment score for Kent.

## **2 Improvement Suggestions**

As I have already mentioned, from my interpretation of the data and text provided by these data frames I believe there are a few parts where Kent can improve upon for a better environment score. The improvements range from quantitative data such as pass rates, to qualitative data such as word frequencies within their unit or institutional environment statements. Here are the suggestions I have to help achieve a higher environment score.

### **2.1 Eligible Staff Submission Rate**

For my first suggestion, I decided to focus onto the `resultsSummary` data frame. This gave me a summary of all data from universities with a better or worse environment score than Kent. With this data frame I focused on data with the column `TYPE` being `ENV WORSE THAN KENT` ascending, as well as focusing on data with the column `TYPE` being `ENV BETTER THAN KENT` descending. This gave me the information on the top performing universities and the best universities which had a lower environment score than Kent. Now, when looking at how many eligible staff submitted as well as looking at how well they did, there is a clear link between how well a universities environment score was and how many staff submitted with a high score.

For example, the top performing university in `ENV WORSE THAN KENT` was **Birkbeck College**, with 100% of eligible staff submitted with a 50/50 split of 2- and 3-star submissions (with the highest possible being 4 stars). The top performing university in the `ENV BETTER THAN KENT` was **The University of Manchester**, 100% of eligible staff submitted with all of them achieving 4-star submissions. From the data I have got from my python snippets, I can infer and suggest that Kent make sure that every eligible staff

<sup>37</sup> member submit as well as making sure they have had the correct guidance and education  
<sup>38</sup> to achieve the highest rating possible as data shows these two have a close relation with  
<sup>39</sup> a better environment score.

<sup>40</sup> Another point to add is when focusing onto the FTE columns you can see that there  
<sup>41</sup> is a lower FTE of submitted staff in universities with a lower environment score and the  
<sup>42</sup> FTE is a lot higher universities with a better environment score when comparing to Kent.  
<sup>43</sup> FTE stands for Full Time Equivalent, which kind of means that the higher FTE the more  
<sup>44</sup> workload the university handles which infers more staff. The highest scoring university  
<sup>45</sup> (Manchester) had plus 18.40 over Kent's FTE score and the top performing university in  
<sup>46</sup> the lower than data had negative 9.1 under Kent's FTE score (Birkbeck College). This  
<sup>47</sup> data leads me to the suggestion that Kent should increase their FTE, this ultimately  
<sup>48</sup> means a higher workload and more staff which links to a higher environment score.

## <sup>49</sup> **2.2 Number Of Doctorates From 2013 To 2019**

<sup>50</sup> Another suggestion I can give for increasing the environment score is increasing the  
<sup>51</sup> number of doctorates per year, after looking at the data provided in the docAwards  
<sup>52</sup> data frame I can see that the higher the annual number of doctorates the higher the  
<sup>53</sup> environment score. The way I manipulated the data to easily see this relation between  
<sup>54</sup> them is by getting the mean number of doctorates per year for each university and adding  
<sup>55</sup> it to a new column in the data frame being `Mean number of doctoral degrees`.

<sup>56</sup> When looking at **Manchester** and **Birkbeck College** again it further suggests that  
<sup>57</sup> this is a good suggestion, in the **ENV BETTER THAN KENT**, Manchester is second place this  
<sup>58</sup> time with a mean annual number of doctorates being 32.4. The top university this time  
<sup>59</sup> was **University of Southampton** with an annual number of 34.4, Southampton was  
<sup>60</sup> third best within my first suggestion. Within **ENV WORSE THAN KENT**, Birbeck has fallen  
<sup>61</sup> down to eighth best university with an annual number of doctorates being 3.2. After  
<sup>62</sup> looking at the data I have generated from the data frame, the fact that Birbeck has fallen  
<sup>63</sup> behind due to a lower number of doctorates and Manchester has near enough stayed  
<sup>64</sup> the same due to having a high number of doctorates annually tells me that doctorates  
<sup>65</sup> play a big part of a great environment score. This leads me to believe that suggesting  
<sup>66</sup> Kent to increase the number of doctorates annually would most definitely increase the  
<sup>67</sup> environment score.

## <sup>68</sup> **2.3 Number Of Distinct Tokens In Unit Environment Statements**

<sup>70</sup> Now, focusing on the text you can see a link between the number of unique tokens  
<sup>71</sup> and top performing universities. After manipulating the text provided in `unit_df`, I

72 can see that the top universities (such as Manchester) have a greater number of unique  
73 tokens in their unit environment statements when compared to the best universities who  
74 performed worse than Kent (such as Liverpool). The `unit_df` holds the unit environment  
75 statement of each university. This is why I am going to make the suggestion for Kent  
76 that they increase the number of unique tokens within their unit statement. The way I  
77 got all unique tokens was firstly I made all tokens lowercase before processing the unique  
78 amount of tokens, as this would inflate the number without it making it inaccurate, then  
79 I got the length of the data set holding the unique tokens. The results I got are as follows.

80 Manchester's distinct token count was 3059, while Liverpool's was 2235, the reason I  
81 am not using Birbeck College is because they do not have a unit statement which further  
82 supports the need of one as well one with distinct words. Once I had the text processed  
83 like this, I decided to go a step further to further validate my suggestions as well as  
84 the evidence I am giving to support it. My next step was to take out stop words as  
85 well as punctuation and add it to a new column in the data frame called `distinct_no`  
86 `stopwords or punctuation`. When recounting the stop words without punctuation or  
87 stop words, the results maintain their purpose, that being showing that the universities  
88 with lower distinct words are performing worse in the environment score. Whether this  
89 distinct word count is lower due to an increase of stopwords or just a decrease in distinct  
90 words, either way the point still stands. University of Manchester's distinct word count  
91 is now 2188 while Liverpool's is now 1800. After looking at the text, my suggestion still  
92 stands for increasing unique words within the unit statement while keeping stop words  
93 to a minimum.

### 94 **3 Conclusion**

95 To conclude my findings and suggestions for Kent, when compared to other universities  
96 Kent has overall done well to get a good environment score. But there is room for  
97 improvement. The suggestions I mentioned are a good place to start, those being all staff  
98 submitting as well as aiming to achieve a high score, increasing the number of doctorates  
99 given out on an annual basis and increasing the number of distinct tokens found within  
100 the unit environment statement. These all will help increase the environment score.

101 Furthermore, there are a few more processing techniques that could be used to suggest  
102 other actions that could increase the environment score, for example for the text, speech  
103 tagging can be used to see what kind of words are used and to see which kinds of words  
104 are used in relation to a high environment score, for example a high use of nouns or  
105 adjectives may be used in universities with a higher environment score. For the data,  
106 looking into the annual income as well as where the income comes from may show a link

107 towards a higher environment score, this can be found within the `researchIncome` data  
108 frame.

109 So in the end, these are the improvements I am suggesting with the aim of improving  
110 the environment score, I believe the evidence I have provided supports that these will  
111 indeed improve the environment score as well as the extra improvements I have suggested.

## 112 A Appendix: Code Snippets

### 113 A.1 Code Snippet For: Eligible Staff Submission Rate

```
# result worse than kent ascending
results_worse_descending = resultsSummary[(resultsSummary
    ['TYPE'] == 'ENV WORSE THAN KENT') & (resultsSummary['
    Profile'] == 'Environment')].sort_values(by = '
    Environment +-', ascending=False)
results_worse_descending.head(100)

# results better than kent descending
results_better_descending = resultsSummary[((
    resultsSummary['TYPE'] == 'ENV BETTER THAN KENT') & (
    resultsSummary['Profile'] == 'Environment')].
    sort_values(by = 'Environment +-', ascending=False)
results_better_descending.head(100)
```

Listing 1: Best Environment Scores For Worse And Better Than Kent

### 114 A.2 Code Snippet For: Number Of Doctorates From 2013 To 115 2019

```
# get the mean number of doctirates from 2013 to 2019 for
universities scoring better than kent
docAwards['Mean number of doctoral degrees'] =
    docAwards[['Number of doctoral degrees awarded in
    academic year 2013', 'Number of doctoral degrees
    awarded in academic year 2014',
    'Number of doctoral degrees awarded in
    academic year 2015', 'Number of
    doctoral degrees awarded in academic
    year 2016',
```

```

'Number of doctoral degrees awarded in
academic year 2017', 'Number of
doctoral degrees awarded in academic
year 2018',
'Number of doctoral degrees awarded in
academic year 2019']] .mean(axis=1)

docAwards_better_descending = docAwards[docAwards['Sample
'] == 'ENV BETTER THAN KENT'].sort_values(by='Mean
number of doctoral degrees', ascending=False)
docAwards_better_descending.head(100)

# get the mean number of doctirates from 2013 to 2019 for
universities scoring worse than kent
docAwards['Mean number of doctoral degrees'] =
docAwards[['Number of doctoral degrees awarded in
academic year 2013', 'Number of doctoral degrees
awarded in academic year 2014',
'Number of doctoral degrees awarded in
academic year 2015', 'Number of
doctoral degrees awarded in academic
year 2016',
'Number of doctoral degrees awarded in
academic year 2017', 'Number of
doctoral degrees awarded in academic
year 2018',
'Number of doctoral degrees awarded in
academic year 2019']] .mean(axis=1)

docAwards_better_descending = docAwards[docAwards['Sample
'] == 'ENV WORSE THAN KENT'].sort_values(by='Mean
number of doctoral degrees', ascending=False)
docAwards_better_descending.head(100)

```

Listing 2: Mean Number Of Doctorates From 2013 To 2019 For Worse And Better Than Kent Per Year

116 **A.3 Code Snippet For: Number Of Distinct Tokens In Unit  
117 Environment Statements**

```
# how many distinct tokens are there?  
unit_df['distinct tokens'] = unit_df['new'].apply(set).  
    apply(len)  
# unit_df.head()  
# The University Of Manchester  
unit_df[unit_df.index == 'The University of Manchester']  
# Birkbeck College or Liverpool John Moores University  
unit_df[unit_df.index == 'Liverpool John Moores  
    University']
```

Listing 3: Number Of Distinct Tokens In Unit Statement

```
# Remove all stop words and punctuation from the tokens  
from nltk.corpus import stopwords  
unit_df['no stopwords no punctuation'] = unit_df['new'].  
    apply(lambda remove : [word for word in remove if word  
        .isalpha() and word not in stopwords.words('english')  
    ])  
# count distinct tokens again  
unit_df['distinct no stopwords or punctuation'] = unit_df  
    ['no stopwords no punctuation'].apply(set).apply(len)  
# unit_df.head()  
unit_df[unit_df.index == 'The University of Manchester']  
unit_df[unit_df.index == 'Liverpool John Moores  
    University']
```

Listing 4: Number Of Distinct Tokens In Unit Statement Without Punctuation And Stop Words